Machine Learning (MC 321) Lab Assignment 6

March 3, 2025

Question 1

Perform binary classification using logistic regression on the data in file "Social Network Ads.csv", which is a categorical dataset to determine whether a user purchased a product or not by using three features.

- 1. Visualize the data by 3D plotting features using different colors for label 0 and 1.
- 2. Implement the logistic function and learn the model parameters using:
 - Stochastic gradient descent method.
 - Gradient descent with momentum and Regularization.
 - Newton's method (iteratively reweighted least squares method) and Regularization. Does the IRLS method converge in fewer iterations than GD?
 - Do a performance comparison between gradient descent with momentum and Newton's method.
- 3. Plot the training data, test data, and decision boundary learnt by logistic regression in the same figure. (It should be a straight line showing the boundary separating the region where $h_w(x) > 0.5$ from the region where $h_w(x) \leq 0.5$ ($h_w(x^{(i)}) = \sigma(w^T x^{(i)})$)) for the above three results. Use 90% data points from each set for training and the remaining 10% for testing the accuracy of classification.

Question 2

Consider the Iris flower dataset that contains a set of 150 samples, which consists of 50 samples from each of three species of Iris: setosa (label 0), versicolor (label 1), and virginica (label 2). Each sample was measured in four features: sepal length, sepal width, petal length, and petal width.

Data Preparation and Visualization:

- Split the dataset into a balanced (with respect to the labels) training and test set, containing respectively 80% and 20% of the dataset.
- Visualize the data by 3D plotting features using different colors for label 0,1 and 2.
- Implement the logistic function and learn the model parameters using:
 - Stochastic gradient descent method.
 - Gradient descent with momentum and Regularization.
 - Newton's method (iteratively reweighted least squares method) and Regularization. Does the IRLS method converge in fewer iterations than GD?
 - Do a performance comparison between gradient descent with momentum and Newton's method.
- Plot the training data, test data, and decision boundary learnt by logistic regression in the same figure. (It should be a straight line showing the boundary separating the region where $h_w(x) > 0.5$ from the region where $h_w(x) \leq 0.5$ ($h_w(x^{(i)}) = \sigma(w^T x^{(i)})$)) for the above three results. Use 90% data points from each set for training and the remaining 10% for testing the accuracy of classification.